Statistical models for pedestrian behaviour in front of bottlenecks

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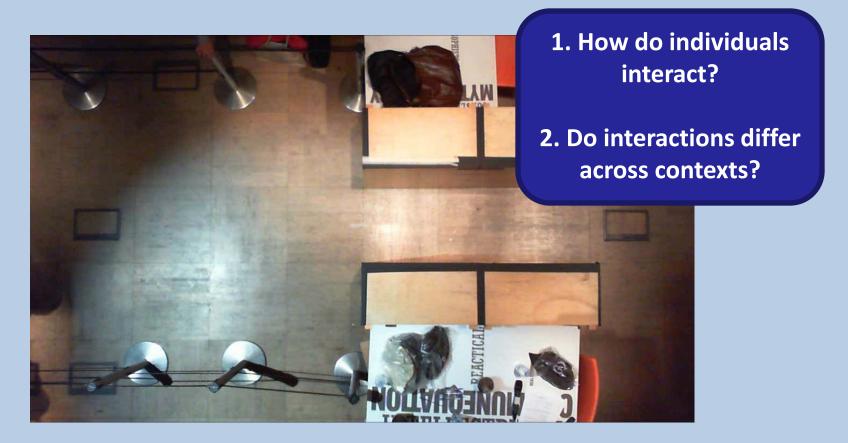
# **Movement of pedestrian crowds**



#### **Movement of pedestrian crowds**

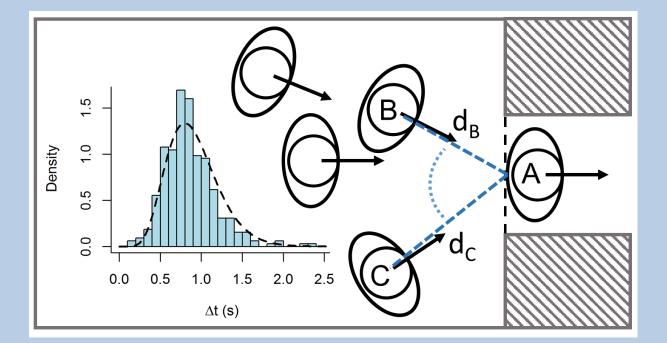


#### Focus on bottleneck scenario



Model microscopic interactions in front of bottleneck.

### Time between consecutive pedestrians



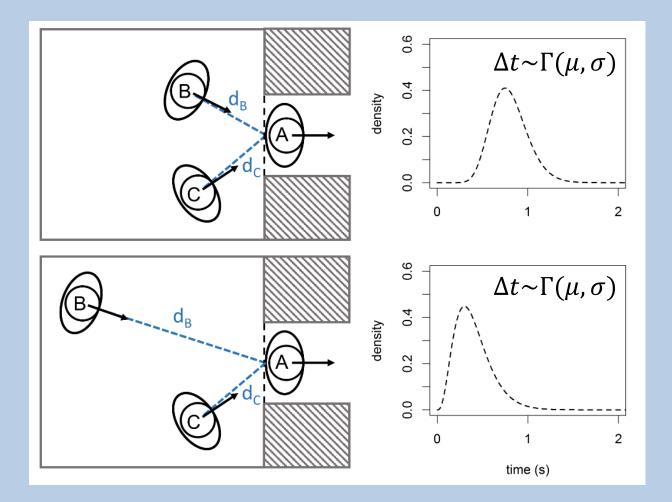
**Statistical models:** 

 $\Delta t \sim \Gamma(\mu, \sigma)$ 

$$\mu = [p_1(d_C - d_B) - p_2]^2$$

e.g.

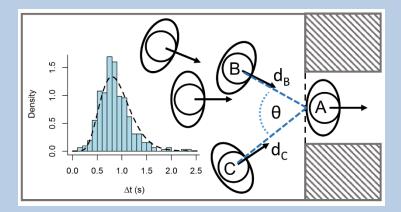
## Example



# **Candidate models**

Models for  $\mu$ :

- $m_0$ : assume  $\mu$  is constant
- $m_1$ : assume  $\mu$  depends on density



- $m_2$ : assume  $\mu$  depends on difference in distance between *B* and *C*
- $m_3$ : assume  $\mu$  depends on angle between B and C
- $m_4$ : assume  $\mu$  depends on distance of closest pedestrian

... consider combinations of models...

# **Model fitting**

Statistical models:

 $\Delta t \sim \Gamma(\mu, \sigma)$ 

p.d.f. of gamma distribution:

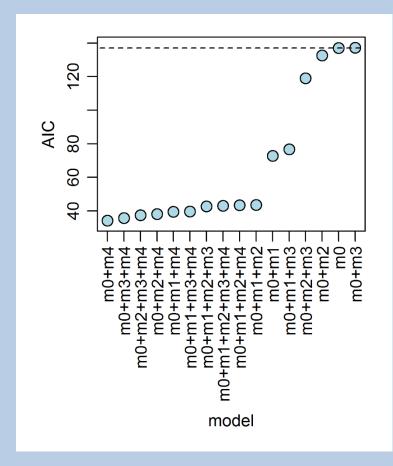
 $f_{\Gamma}$ 

Likelihood of a model:  $L = \prod_{k} f_{\Gamma}(\Delta t_{k}; \mu_{k}, \sigma)$ 

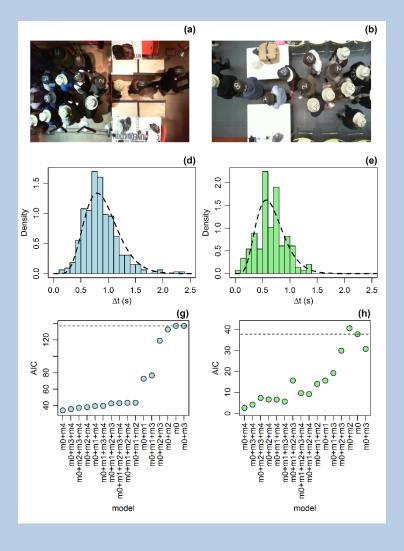
(assume models describe dependencies between consecutive  $\Delta t_k$ )

Find model parameters that maximise *L*.

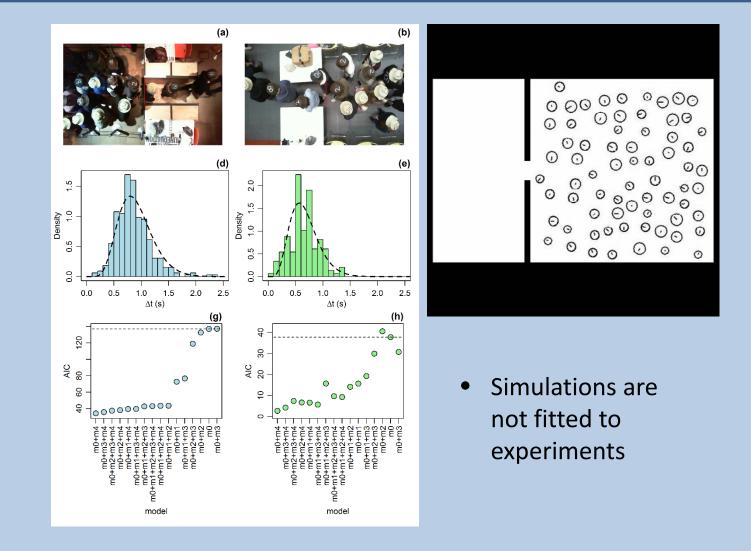
#### **Model selection**



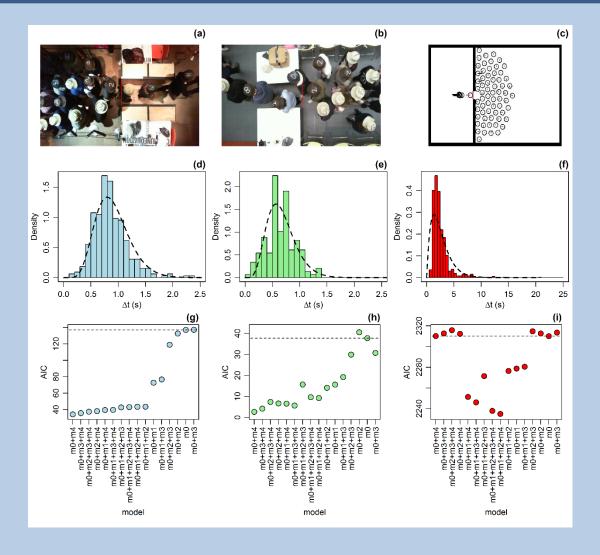
### **Comparing different contexts**



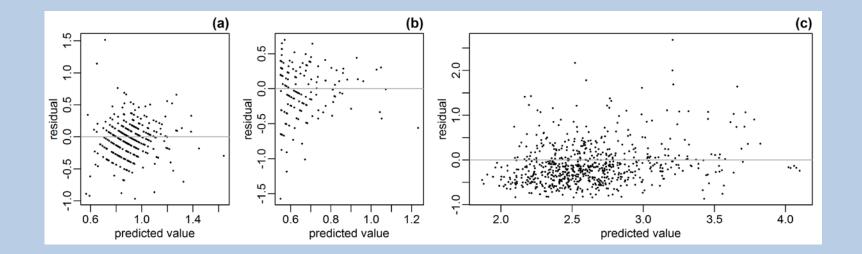
### **Comparing different contexts**



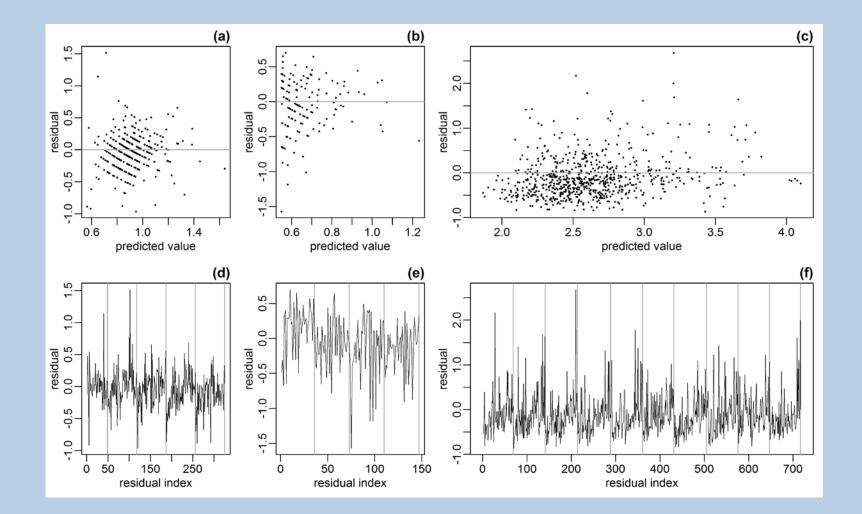
### **Comparing different contexts**



### **Residual plots**



#### **Residual plots**



# Summary

- Can isolate most likely mechanism from candidates.
- Can use this to compare microscopic behaviour across contexts (*check simulation models*).
- Residual plots highlight aspects not explained by statistical models.

NOTE: if interactions inside bottleneck are important, the approach may not be appropriate.

## **Further work**

- Framework is general and can be extended (e.g. social groups, age differences).
- Apply to a range of experiments/models.
- Consider wider exits.
- Investigate changes in behaviour over time.

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